

**Data S1 - Online supporting information for *Occupancy Modeling Species-Environment Relationships with Non-ignorable Sampling Designs***

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***Data S1: R-code to recreate empirical example results using pseudo-likelihood and likelihood estimation for single- season occupancy models.***

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This Appendix includes the R code used for recreating the results in Figure 2. These files require the dplyr and ggplot2 packages.

1. OR\_model\_fits.R:

This file fits the single-season occupancy model using P-ML and ML for all three species and returns Figure 2 in the main text.

2. or\_covs.csv:

contains the empirical example Oregon dataset with columns for CONUS\_10KM (= sample unit ID), Elevation\_mean, and Forest\_Percent\_Gap for all sample units in Oregon ( $N = 2660$ ). Elevation\_mean was based on US Geological Survey 10-m digital elevation model and summarized to the 10-km x 10-km sample unit (<https://lta.cr.usgs.gov/NED>). Forest\_Percent\_Gap was created from GAP land cover 30-m resolution land cover map

(<https://gapanalysis.usgs.gov/gaplandcover/>). Forest cover was based on aggregated ‘forest and woodland systems’ and summarized to each 10-km x 10-km sample unit.

3. lano\_dets.csv:

Sample Unit ID is the same as CONUS\_10KM in or\_covs.csv. Each row is the observed detection/non-detection history for silver-haired bat (LANO; *Lasionycteris noctivagans*) at each of 91 sample units in 2016.

4. mylu\_dets.csv:

Sample Unit ID is the same as CONUS\_10KM in or\_covs.csv. Each row is the observed detection/non-detection history for little brown myotis (MYLU; *Myotis lucifugus*) at each of 91 sample units in 2016.

5. myvo\_dets.csv:

Sample Unit ID is the same as CONUS\_10KM in or\_covs.csv. Each row is the observed detection/non-detection history for long-legged myotis (MYVO; *Myotis volans*) at each of 91 sample units in 2016. The column SurveyType is the strata membership for the 91 surveyed sample units in 2016: “Prob” for the NABat Oregon sample units, “nonprob” for the legacy sites, or “FWS” for the NABat FWS R1 sample units.

6. pmle\_functions.R:

This file is the required code for implementing the models called in the file “OR\_model\_fits.R.”

It contains two functions:

- *logL.fun*: log-likelihood of a proposed occupancy model with sample weights
- *occ\_pmle*: fits the single-season occupancy model with required inputs for occupancy model; detection model; detection history matrix, NAs okay; dataframe of site-level covariates; named list of visit-level covariates; vector of weights for PMLE fits.

Example call to function to estimate occupancy model using P-MLE with forest and elevation occupancy covariates and constant detection for MYVO.

```

occ_pmle(~forest+elev.m,
          ~1,
          myvo_dh,
          myvo_cov2,
          list(blank=myvo_dh),
          weights = myvo_wts)

```

Returns the following output (example for MYVO P-MLE results):

\$params

```
[1] "alpha[0]" "beta[0]" "beta[1]" "beta[2]"
```

\$estimates

```
[1] -0.72918766  2.73029511  2.24911931  0.01662806
```

\$std.errors

```
[1] 0.1527564 1.3974652 1.1977440 0.4570784
```

\$hessian

	[,1]	[,2]	[,3]	[,4]
[1,]	50.5219064	5.790555	-5.092232	0.1891535
[2,]	5.7905550	5.897079	-6.411697	0.2035330
[3,]	-5.0922315	-6.411697	7.845033	-1.1351340
[4,]	0.1891535	0.203533	-1.135134	5.7853115

\$converge

```
[1] 0
```

\$AIC

[1] 372.8027